

# Volume Visualization

## Overview: Volume Visualization (1)

- Introduction to volume visualization
  - ◆ On volume data
  - ◆ Voxels vs. cells
  - ◆ Interpolation
  - ◆ Gradient
  - ◆ Classification
  - ◆ Transfer Functions (TF)
  - ◆ Slice vs surface vs. volume rendering
  - ◆ Overview: techniques

## Overview: Volume Visualization (2)

- Simple methods
  - ◆ Slicing, multi-planar reconstruction (MPR)
- Direct volume visualization
  - ◆ Image-order vs. object-order
  - ◆ Raycasting
  - ◆  $\alpha$ -compositing
  - ◆ Hardware volume visualization
- Indirect volume visualization
  - ◆ Marching cubes

## Volume Visualization

- Introduction:
  - ◆ VolVis = visualization of volume data
    - Mapping 3D → 2D
    - Projection (e.g., MIP), slicing, vol. rendering, ...
  - ◆ Volume data =
    - 3D × 1D data
    - Scalar data, 3D data space, space filling
  - ◆ User goals:
    - Gain insight in 3D data
    - Structures of special interest + context

## Volume Data

- Where do the data come from?
  - ◆ Medical Application
    - Computed Tomographie (CT)
    - Magnetic Resonance Imaging (MR)
  - ◆ Materials testing
    - Industrial-CT
  - ◆ Simulation
    - Finite element methods (FEM)
    - Computational fluid dynamics (CFD)
  - ◆ etc.

## 3D Data Space

- How are volume data organized?
  - ◆ Cartesian resp. regular grid:
    - CT/MR: often  $dx=dy<dz$ , e.g. 135 slices (z)  $\rightarrow 512^2$  values (as x & y pixels in a slice)
    - Data enhancement: iso-stack-calculation = Interpolation of additional slices, so that  $dx=dy=dz \Rightarrow 512^3$  Voxel
  - Data: Cells (cuboid), Corner: Voxel
  - ◆ Curvi-linear grid resp. unstructured:
    - Data organized as tetrahedra or hexahedra
    - Often: conversion to tetrahedra

## VolVis – Challenges

- **Rendering projection,**  
so much information and so few pixels!
- **Large data sizes,** e.g.  
 $512 \times 512 \times 1024$  voxel  $\text{à } 16 \text{ bit} = 512 \text{ Mbytes}$
- **Speed,**  
Interaction is very important,  $>10 \text{ fps!}$

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## Voxels vs. Cells

- Two ways to interpret the data:
  - ◆ Data: set of voxel
    - **Voxel** = abbreviation for volume element (cf. pixel = "picture elem.")
    - Voxel = point sample in 3D
    - Not necessarily interpolated
  - ◆ Data: set of cells
    - Cell = cube primitive (3D)
    - Corners: 8 voxel (see above)
    - Values in cell: interpolation used

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## Interpolation

$v = S(\text{rnd}(x), \text{rnd}(y), \text{rnd}(z))$

Nearest Neighbor

$v = (1-x)(1-y)(1-z)S(0,0,0) + (x)(1-y)(1-z)S(1,0,0) + (1-x)(y)(1-z)S(0,1,0) + (x)(y)(1-z)S(1,1,0) + (1-x)(1-y)(z)S(0,0,1) + (x)(1-y)(z)S(1,0,1) + (1-x)(y)(z)S(0,1,1) + (x)(y)(z)S(1,1,1)$

Trilinear

## Interpolation – Results

Nearest Neighbor Interpolation

Trilinear Interpolation

## Gradients in Volume Data

- Volume data:  $f(\mathbf{x}) \in \mathbb{R}^1, \mathbf{x} \in \mathbb{R}^3$
- Gradient  $\nabla f$ : 3D vector points in direction of largest function change
- Gradient magnitude: length of gradient
- Emphasis of changes:
  - ◆ Special interest often in transitional areas
  - ◆ Gradients: measure degree of change (like surface normal)
  - ◆ Larger gradient magnitude  $\Rightarrow$  larger opacity

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## Gradients as Normal Vector Replacement

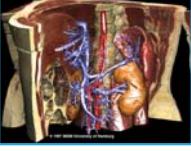
- Gradient  $\nabla f = (\partial f / \partial x, \partial f / \partial y, \partial f / \partial z)$
- $\nabla f|_{x_0}$  normal vector to iso-surface  $f(x_0) = f_0$
- Central difference in x-, y- & z-direction (in voxel):
 
$$\nabla f(x, y, z) = 1/2 \begin{pmatrix} f(x+1) - f(x-1) \\ f(y+1) - f(y-1) \\ f(z+1) - f(z-1) \end{pmatrix}$$
- Then tri-linear interpolation within a cell
- **Alternatives:**
  - ◆ Forward differencing:  $\nabla f(x) = f(x+1) - f(x)$
  - ◆ Backwards differencing:  $\nabla f(x) = f(x) - f(x-1)$
  - ◆ Intermediate differencing:  $\nabla f(x+0.5) = f(x+1) - f(x)$

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## Classification

**Assignment data  $\Rightarrow$  semantics:**

- Assignment to objects, e.g., bone, skin, muscle, etc.
- Usage of data values, gradient, curvature
- Goal: segmentation
- Often: semi-automatic resp. manual
- Automatic approximation: transfer functions (TF)

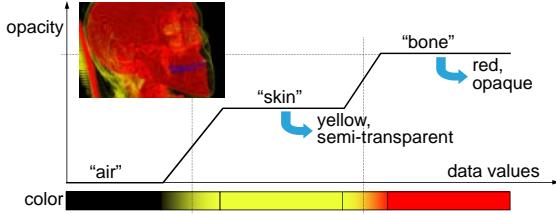


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## Transfer Functions (TF)

**Mapping data  $\rightarrow$  "renderable quantities":**

- 1.) data  $\rightarrow$  color ( $f(i) \rightarrow C(i)$ )
- 2.) data  $\rightarrow$  opacity (non-transparency) ( $f(i) \rightarrow \alpha(i)$ )

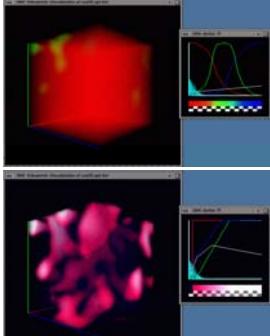


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## Different Transfer Functions

**Image results:**

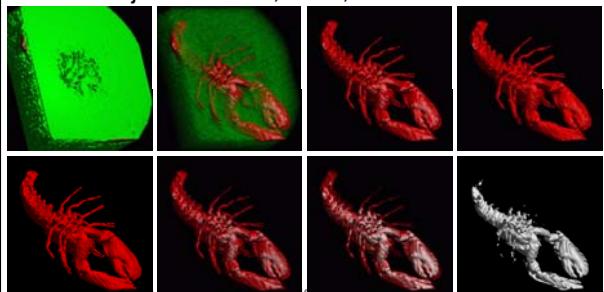
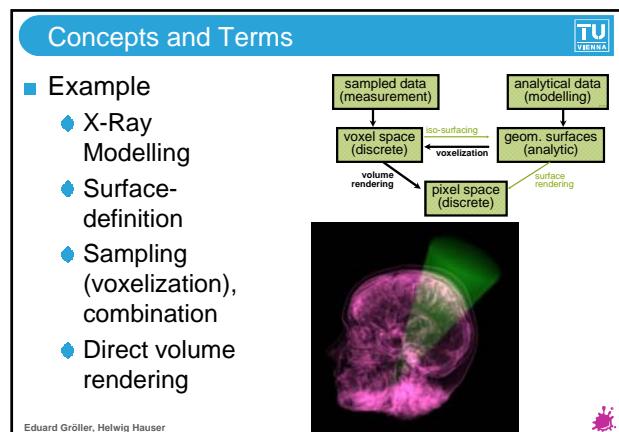
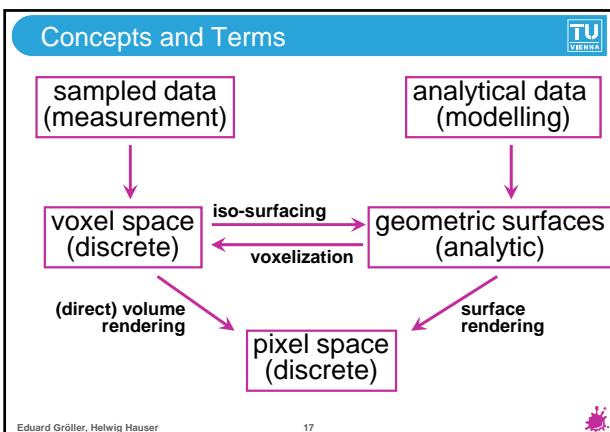
- Strong dependence on transfer functions
- Non-trivial specification
- Limited segmentation possibilities



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## Lobster – Different Transfer Functions

**Three objects: media, shell, flesh**

## Slice vs. Surface vs. Volume Rendering

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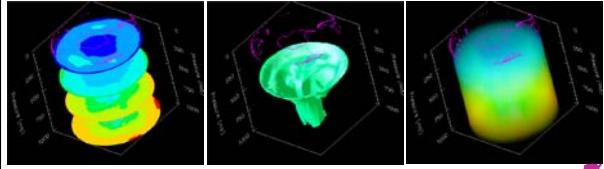
- Slice rendering
  - ◆ 2D cross-section from 3D volume data
- Surface rendering:
  - ◆ **Indirect** volume visualization
  - ◆ Intermediate representation: iso-surface, "3D"
  - ◆ Pros: Shading→Shape!, HW-rendering
- Volume rendering:
  - ◆ **Direct** volume visualization
  - ◆ Usage of transfer functions
  - ◆ Pros: illustrate the interior, semi-transparency

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## Slices vs. Iso-Surfaces. vs. Volume Rendering

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- Comparison ozon-data over Antarctica:
  - ◆ Slices: selective (z), 2D, color coding
  - ◆ Iso-surface: selective ( $f_0$ ), covers 3D
  - ◆ Vol. rendering: transfer function dependent, "(too) sparse – (too) dense"



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## VolVis-Techniques – Overview

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- Simple methods:
  - ◆ Slicing, MPR (multi-planar reconstruction)
- Direct volume visualization:
  - ◆ Ray casting
  - ◆ Shear-warp factorization
  - ◆ Splatting
  - ◆ 3D texture mapping
  - ◆ Fourier volume rendering
- Surface-fitting methods:
  - ◆ Marching cubes (marching tetrahedra)

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## Simple Methods

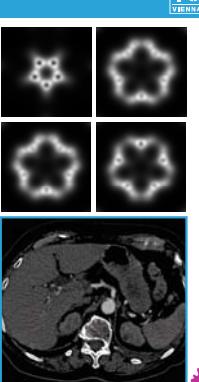
Slicing, etc.



## Slicing

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- Slicing:
  - ◆ Axes-parallel slices
  - ◆ Regular grids: simple
  - ◆ Without transfer function no color
  - ◆ Windowing: adjust contrast
- General grid, arbitrary slicing direction



white  
black

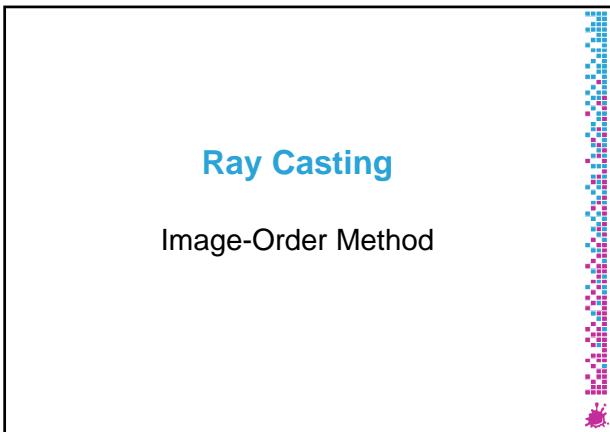
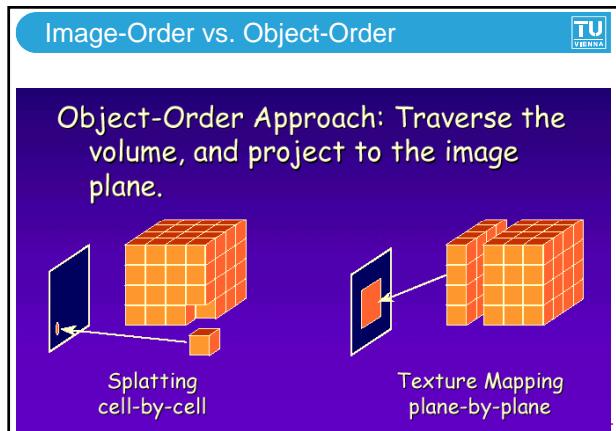
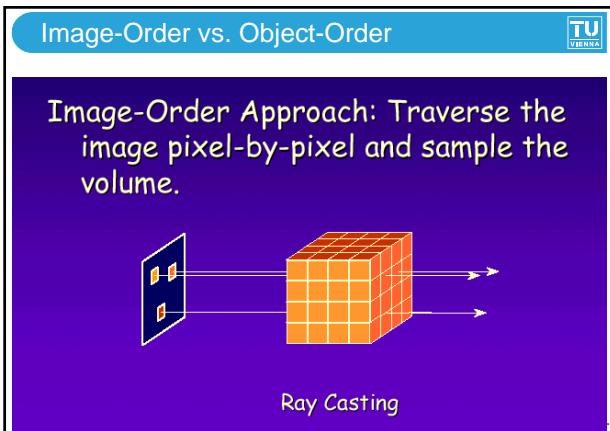
Window

data values

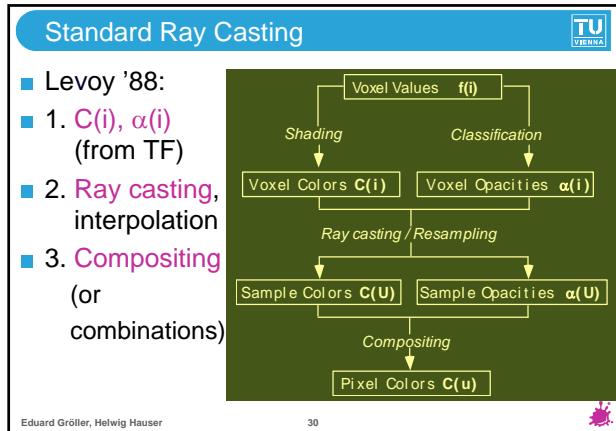
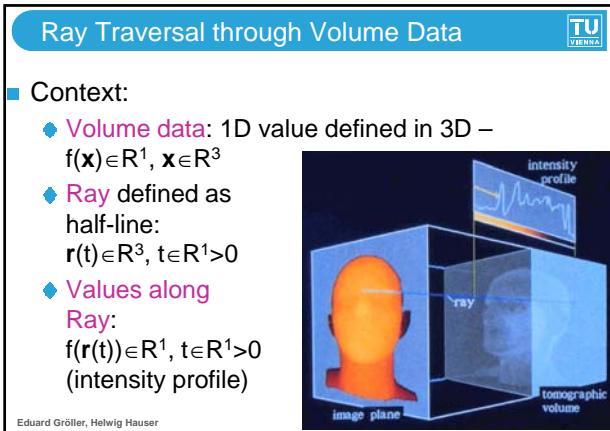
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## Direct Volume Visualization





- Ray Tracing vs. Ray Casting**
- **Ray Tracing:** method from image generation
  - In volume rendering: **only viewing rays**  
⇒ therefore Ray Casting
  - Classical **image-order** method
  - **Ray Tracing:** ray – object intersection  
**Ray Casting:** no objects, density values in 3D
  - **In theory:** take all density values into account!  
**In practice:** traverse volume step by step
  - **Interpolation** necessary for each step!
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### 1. Shading, Classification

**1. Step:**

- ◆ Shading,  $f(i) \rightarrow C(i)$ :
  - Apply transfer function
  - diffuse illumination (Phong), gradient  $\approx$  normal
- ◆ Classification,  $f(i) \rightarrow \alpha(i)$ :
  - Levoy '88, gradient enhanced
  - Emphasizes transitions
- ◆ Nowadays: shading/classification after ray-casting/resampling

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### 2. Ray Traversal – Three Approaches

regular sampling: equidistant samples, all voxels used once

scan conversion: samples weighted by lengths of ray segments

voxel intersections: samples weighted by lengths of ray segments

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### 3. Types of Combinations

**Overview:**

- ◆ MIP  $\Rightarrow$  MaxIntensity
- ◆ Compositing  $\Rightarrow$  Accumulate
- ◆ X-Ray  $\Rightarrow$  Average
- ◆ First hit  $\Rightarrow$  First

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### Types of Combinations

**Possibilities:**

- ◆  $\alpha$ -compositing
- ◆ Shaded surface display (first hit)
- ◆ Maximum-intensity projection (MIP)
- ◆ X-ray simulation
- ◆ Contour rendering

DVR, SSD, NPR, x-ray, MIP

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### $\alpha$ -Compositing – a Specific Optical Model for Volume Rendering

Display of  
Semi-Transparent Media

### Modelling of Natural Phenomena

**Various models (Examples):**

- ◆ Emission only (light particles)
- ◆ Absorption only (dark fog)
- ◆ Emission & absorption (clouds)
- ◆ Single scattering, w/o shadows
- ◆ Multiple scattering

**Two approaches:**

- ◆ Analytical model (via differentials)
- ◆ Numerical approximation (via differences)

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## Emission and Absorption

**Continuous model (no scattering):**

- At each position is given:
  - Emission  $g(t)$
  - Extinction coefficient  $\tau(t)$
  - Differential  $dI/dt = g(t) - \tau(t)I(t)$
  - Emission  $g(t)$  attenuated by  $T(t,s)$
  - Only Emission:  $I_0 + \int_{t \in [0,s]} g(t) dt$
  - With Absorption:  $I_0 \cdot T(0,s) + \int_{t \in [0,s]} g(t) \cdot T(t,s) dt$
  - Emission und Absorption:

$$I_0 \cdot \exp(-\int_{u \in [0,s]} \tau(u) du) + \int_{t \in [0,s]} g(t) \cdot \exp(-\int_{u \in [t,s]} \tau(u) du) dt$$

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## Numerical Approximation

**Discrete model (compositing):**

- For each volume extent  $i$ :
  - Contribution  $C_i$
  - Opacity  $\alpha_i$ , transparency  $1-\alpha_i$
  - $Out_i = In_i \cdot (1-\alpha_i) + C_i \cdot \alpha_i$  (Std.-compositing)
  - Convex combination from background and own contribution
  - $Out_s = In_0 \cdot \prod_{s \geq k \in N} (1-\alpha_k) + \sum_{s \geq k \in N} C_k \cdot \alpha_k \cdot \prod_{s \geq l > k} (1-\alpha_l)$
  - Opacity-weighted colors:  $C_i \cdot \alpha_i$  instead of  $C_i$

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## Emission and Absorption

**Differential model:**

- $I(s) = I_0 \cdot T(0,s) + \int_{t \in [0,s]} g(t) \cdot T(t,s) dt$
- $I(s) = I_0 \cdot \exp(-\int_{u \in [0,s]} \tau(u) du) + \int_{t \in [0,s]} g(t) \cdot \exp(-\int_{u \in [t,s]} \tau(u) du) dt$

**Discrete Approximation:**

- $Out_i = In_i \cdot (1-\alpha_i) + C_i \cdot \alpha_i$  (Compositing)
- $Out_s = In_0 \cdot \prod_{s \geq k \in N} (1-\alpha_k) + \sum_{s \geq k \in N} C_k \cdot \alpha_k \cdot \prod_{s \geq l > k} (1-\alpha_l)$

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## Emission or/and Absorption

Emission only	
Absorption only	
Emission and Absorption	

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## Compositing: F2B vs. B2F

**Back-to-Front (B2F):**

- $Out_i = In_i \cdot (1-\alpha_i) + C_i \cdot \alpha_i, In_{i+1} = Out_i \dots$
- Depending on local transparency ( $1-\alpha_i$ )  $\Rightarrow$  convex combination of old  $In_i$  & new  $C_i$
- Example:
  - Voxel i:  $C_i = \text{red}, \alpha_i=30\%$ ; so far:  $In_i = \text{white}$
  - Result of compositing: 70% white + 30% red

**Front-to-Back (F2B):**

- $Col = Col + (1-\alpha_{akk}) \cdot C_i \cdot \alpha_i \dots$  accumulated color
- $\alpha_{akk} = \alpha_{akk} + (1-\alpha_{akk}) \cdot \alpha_i \dots$  accumulated opacity

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## Ray Casting – Examples

**CT scan of human hand (244x124x257, 16 bit)**

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### Ray Casting – Examples

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### Ray Casting – Further Examples

■ Tornado Visualization:

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### Ray Casting – Further Examples

■ Molecular data:

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### Hardware-Volume Visualization

Faster with Hardware?!

### Two Approaches

- 3D-textures:
  - ◆ Volume data stored in 3D-texture
  - ◆ Proxy geometry (slices) parallel to image plane, are interpolated tri-linearly
  - ◆ Back-to-front compositing
- 2D-textures:
  - ◆ 3 stacks of slices (x-, y- & z-axis), slices are interpolated bi-linearly
  - ◆ Select stack (most "parallel" to image plane)
  - ◆ Back-to-front compositing

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### Variation of View Point

- 3D-textures:
  - ◆ Number of slices arbitrary
- 2D-textures:
  - ◆ Stack change: discontinuity

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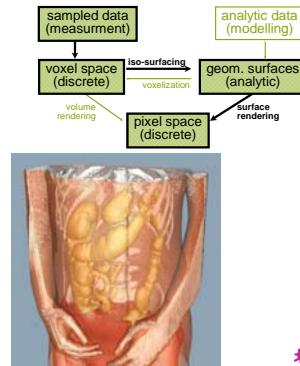
## Indirect Volume Visualization

### Iso-Surface-Display

#### Concepts and Terms

- Example
  - ◆ CT measurement
  - ◆ Iso-stack-conversion
  - ◆ Iso-surface-calculation (marching cubes)
  - ◆ Surface rendering (OpenGL)

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#### Iso-Surfaces

- Intermediate representation
- Aspects:
  - ◆ Preconditions:
    - expressive Iso-value, Iso-value separates materials
    - Interest: in transitions
  - ◆ Very selective (binary selection / omission)
  - ◆ Uses traditional hardware
  - ◆ Shading  $\Rightarrow$  3D-impression!



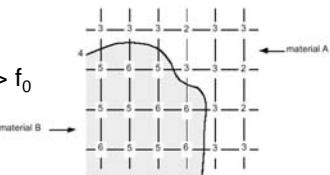
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#### Volume Data $\Leftrightarrow$ Iso-Surfaces

- Iso-Surface:
  - ◆ Iso-value  $f_0$
  - ◆ Separates values  $> f_0$  from values  $\leq f_0$
  - ◆ Often not known  $\rightarrow$
  - ◆ Can only be approximated from samples!
  - ◆ Shape / position dependent on type of reconstruction

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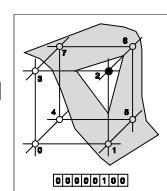


## Marching Cubes (MC)

### Iso-Surface-Display

#### Approximation of Iso-Surface

- Approach:
  - ◆ Iso-Surface intersects data volume = set of all cells
- Idea:
  - ◆ Parts of iso-surface represented on a(n intersected) cell basis
  - ◆ As simple as possible: Usage of triangles



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## Marching Cubes

- ✓ Cell consists of 4(8) pixel (voxel) values:  
 $(i+[01], j+[01], k+[01])$

1. Consider a Cell
2. Classify each vertex as inside or outside
3. Build an index
4. Get edge list from table[index]
5. Interpolate the edge location
6. Go to next cell

*I'm the Marching Cube!*

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## MC 1: Create a Cube

- ✓ Consider a Cube defined by eight data values:

$(i,j,k)$     $(i+1,j,k)$     $(i,j+1,k)$     $(i+1,j+1,k)$   
 $(i,j,k+1)$     $(i+1,j,k+1)$     $(i,j+1,k+1)$     $(i+1,j+1,k+1)$

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## MC 2: Classify Each Voxel

- ✓ Classify each voxel according to whether it lies outside the surface (value > iso-surface value) inside the surface (value  $\leq$  iso-surface value)

$\text{Iso} = 9$   
 $\text{Iso} = 7$   
● = inside  
● = outside

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## MC 3: Build An Index

- ✓ Use the binary labeling of each voxel to create an index

$v_8$     $v_7$     $v_6$     $v_5$     $v_4$     $v_3$     $v_2$     $v_1$

Index:  
 $v_1 \quad v_2 \quad v_3 \quad v_4 \quad v_5 \quad v_6 \quad v_7 \quad v_8$

● inside = 1  
● outside = 0

11110100  
00110000

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## MC 4: Lookup Edge List

- ✓ For a given index, access an array storing a list of edges

The 15 Cube Combinations

all 256 cases can be derived from 15 base cases

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## MC 5: Example

- ✓ Index = 10110001
- ✓ triangle 1 = e4, e7, e11
- ✓ triangle 2 = e1, e7, e4
- ✓ triangle 3 = e1, e6, e7
- ✓ triangle 4 = e1, e10, e6

e11   e7   e6  
e4   e10   e1

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## MC 6: Interp. Triangle Vertex

- ✓ For each triangle edge, find the vertex location along the edge using linear interpolation of the voxel values

$T=5 \quad x = i + \left( \frac{T - v[i]}{v[i+1] - v[i]} \right) \quad T=8$

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## MC 7: Compute Normals

- ✓ Calculate the normal at each cube vertex

$$G_x = V_{x-1,y,z} - V_{x+1,y,z}$$

$$G_y = V_{x,y-1,z} - V_{x,y+1,z}$$

$$G_z = V_{x,y,z-1} - V_{x,y,z+1}$$

$\vec{n} = \frac{\vec{G}}{|\vec{G}|}$

✓ Use linear interpolation to compute the polygon vertex normal

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## MC 8: Ambiguous Cases

- ✓ Ambiguous cases: 3, 6, 7, 10, 12, 13
- ✓ Adjacent vertices: different states
- ✓ Diagonal vertices: same state
- ✓ Resolution: decide for one case

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## Danger: Holes!

■ Wrong vs. correct classification!

Figure 4: Two internal configurations for the Marching Cubes configuration 5

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## MC 9: Asymptotic Decider

- ✓ Assume bilinear interpolation within a face
- ✓ hence iso-surface is a hyperbola
- ✓ compute the point p where the asymptotes meet
- ✓ sign of  $S(p)$  decides the connectedness

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## Marching Cubes - Summary 1

- ✓ 256 Cases
- ✓ reduce to 15 cases by symmetry
- ✓ Complementary cases - (swap in- and outside)
- ✓ Ambiguity resides in cases 3, 6, 7, 10, 12, 13
- ✓ Causes holes if arbitrary choices are made.

(a) Volume data      (b) Isosurface  $S = f(x,y,z)$

(c) Polygonal Approximation

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## Marching Cubes - Summary 2

- ✓ Up to 4 triangles per cube
- ✓ Dataset of  $512^3$  voxels can result in several million triangles (many Mbytes!!!)
- ✓ Iso-surface does not represent an object!!!
- ✓ No depth information
- ✓ Semi-transparent representation --> sorting
- ✓ Optimization:
  - Reuse intermediate results
  - Prevent vertex replication
  - Mesh simplification

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## MC Examples

**1 Iso-surface**

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**2 Iso-surfaces**

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**3 Iso-surfaces**

## Further Examples

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## Even Further Examples

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11-Jul-1996 - 14:00 (Q) Surface Mesh Index & Wilson

18-Jul-1996 - 17:00 Surface Mesh Preprintable Colors & Raytracing

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## Conclusion Volume Visualization

General Remarks

## Surface vs. Volume Rendering

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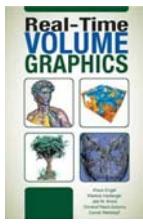
<b>Surface Rendering:</b> <ul style="list-style-type: none"> <li>◆ Indirect representation / display</li> <li>◆ Conveys surface impression</li> <li>◆ Hardware supported rendering (fast?!)</li> <li>◆ Iso-value-definition</li> </ul>	<b>Volume Rendering:</b> <ul style="list-style-type: none"> <li>◆ Direct representation / display</li> <li>◆ Conveys volume impression</li> <li>◆ Often realized in software (slow?!)</li> <li>◆ Transfer functions</li> </ul>
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## Literature, References



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- ◆ Nelson Max: "Optical Models for Direct Volume Rendering" in *IEEE Transactions on Visualization and Computer Graphics*, Vol. 1, No. 2, June 1995
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